



Measurements
on a Network-
Studies and
Techniques

Girija Limaye
07305905

Motivation

Terminologies

Techniques

Discussion and
Examples

Summary and
Conclusion

Measurements on a Network-Studies and Techniques

Girija Limaye
07305905

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Roadmap

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Terminologies

Techniques

Discussion and
Examples

Summary and
Conclusion

- Motivation
- Terminologies
- Techniques
- Discussion and Examples
- Summary and Conclusion



Importance of Measurements

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Terminologies

Techniques

Discussion and
Examples

Summary and
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Some Questions:

- **User:** Why is the delay in mail delivery?
- **Network Provider:** How much time the user X is using network?
- **Analyst:** Which sites do people visit often?
- **Web site owner:** How much time it takes to open the home page after a request is given by the user?



Importance of Measurements (cntd.)

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Terminologies

Techniques

Discussion and
Examples

Summary and
Conclusion

■ End-user's Requirements:

- "always ON"
- Speed

■ Network administrator's Objectives:

- End-to-end performance
- Efficient utilization of resources
- Diagnosis

■ Network Examiner / Analyst's View:

- Response Time, Delay, Loss, Blocking
- Traffic pattern
- Load
- This analysis is useful for admins also



How to measure?

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Motivation

Terminologies

Techniques

Discussion and
Examples

Summary and
Conclusion

Tools

- Bandwidth: *pathchar*
- Number of hops: *traceroute*
- Traffic: *ethereal*
- Reachability: *ping*

Intuition!

- Writing Scripts
- Collecting data
- Generating graphs and tables



Terminologies

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Motivation

Terminologies

Techniques

Discussion and
Examples

Summary and
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Parameter: What we measure

One Way Delay, Round Trip Time, Packet Interarrival Delay,
Packet loss

Metric: What we calculate / estimate

Bandwidth (Capacity, Utilized, Available)
Traffic Pattern
Network State

Active measurements

Introducing (extra) traffic in existing network

Passive measurements

(Only) Monitoring existing network



Various Techniques

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Terminologies

Techniques

Discussion and
Examples

Summary and
Conclusion

- Packet Based
 - Single Packet Probe
 - Packet Pair¹
 - Variable packet size
 - Packet Loss
- Protocol Based
 - TTL field in IP
 - ICMP messages

¹Those in red are covered in the report but not in the presentation



Various Techniques (cntd.)

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Techniques

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Motivation

Terminologies

Techniques

Discussion and
Examples

Summary and
Conclusion

- Delay and Delay Variance Based
 - Self Loading Packet Streams (SLoPS)
- Miscellaneous
 - Single Point Measurements inside the network
 - Statistical Modelling
 - Traces and Inferences

These techniques can be used in combination.



Bayesian Inference of Lossy link

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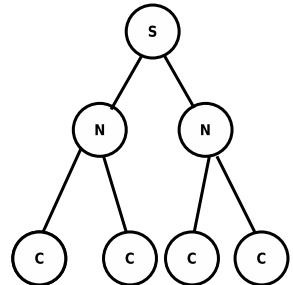
Terminologies

Techniques

Discussion and
Examples

Summary and
Conclusion

- **Problem:** In such a topology, which one is a lossy link?
- **Approach:**
 - Links are shared
 - A path from S to C contains multiple Links
 - Loss observed at client: Function of Loss rates of these intermediate links
 - Can we model Loss rates of links in terms of loss observed at the client?



S: Sender
N: Intermediate Nodes
C: Clients



Bayesian Inference of Lossy link (cntd.)

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Motivation

Terminologies

Techniques

Discussion and
Examples

Summary and
Conclusion

- P_j : Loss probability observed at the client C_j
- $P_j = f(l_i)$ where $i \in$ All intermediate links from S to C_j
- Evidence P_j , conditional to the loss rates of links
- Lossy link is hidden, a Hypothesis
- Use Bayesian Inference: ²
$$P(A|B) = \frac{P(B|A)*P(A)}{P(B)}$$

In short,

Using Packet Loss Technique, Passive Measurements

Parameter: Packet loss

Inferred: Lossy link

²A: Hypothesis, B: Evidence



Estimate Bandwidth

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Motivation

Terminologies

Techniques

Discussion and
Examples

Summary and
Conclusion

- **Problem:** A path from S to D, multi-hop.
Estimate capacity of links on the path.
- **Approach:**
 - Delay $\propto \frac{1}{\text{Bandwidth}}$
 - End-to-End Delay = Sum of delays over each link
 - Can we separately find these components of delays?
 - And use them to infer Bandwidth of “a” link?



```
graph TD; S((S)) -- "1. Packet P, size S(1), TTL = 1" --> N((N)); N -- "2. ICMP Packet, Error: TTL expired" --> S; N --- D((Dropped));
```

1. Packet P, size $S(1)$, TTL = 1

2. ICMP Packet, Error: TTL expired

Dropped



Estimate Bandwidth (cntd.)

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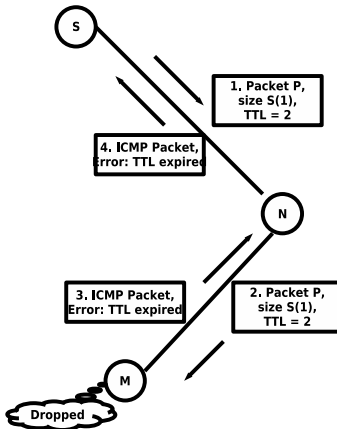
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Techniques

Discussion and
Examples

Summary and
Conclusion

Second case:
Packet sent with
TTL = 2





Estimate Bandwidth (cntd.)

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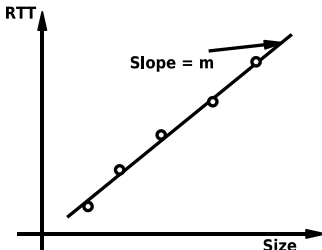
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Terminologies

Techniques

Discussion and
Examples

Summary and
Conclusion



RTT = delay for packet + delay for ICMP packet

So, $RTT = (S / B(1)) + (S(ICMP) / B(1))$

$RTT = (\text{packet size} / \text{bandwidth}) + \text{Constant}$

$$Y = mX + C$$

In short,

Using Single Packet Probe Technique, Active Measurements, TTL Mechanism,
Varying Packet size

Parameter: RTT

Inferred: Capacity (Bandwidth)



Routing changes, Which?, How often?

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Motivation

Terminologies

Techniques

Discussion and
Examples

Summary and
Conclusion

- Why does end-to-end delay change?
 - Traffic Fluctuations
 - Route changed
- So, how does Routing change affect delay?
 - Number of hops increased
 - Links on new route have different properties (lower bandwidths)
- Why is it important?
 - Real Time Applications, Financial Transactions
 - VOIP, multimedia streaming, delay-sensitive



Routing changes, Which?, How often? (cntd.)

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Motivation

Terminologies

Techniques

Discussion and
Examples

Summary and
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- Which Route? **Interdomain / Intradomain**
- Inerdomain
 - Passive Measurement
 - BGP UPDATE Messages
- Intradomain
 - Active Measurement
 - *traceroute* till convergence

Intuition

- Interdomain Routes: Have more impact on delay variation
- Long distance



Routing changes, Which?, How often? (cntd.)

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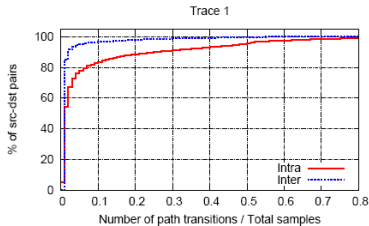
Motivation

Terminologies

Techniques

Discussion and
Examples

Summary and
Conclusion



Observations

- Interdomain routes change less frequently
- Interdomain routes last longer
- Intradomain Routes also have significant impact on delay variation

In short,

Combination of Active and Passive Measurements
Parameter: Delay



How is web traffic?

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Motivation

Terminologies

Techniques

Discussion and
Examples

Summary and
Conclusion

- Significance:
 - How is the traffic? TCP / UDP, Real time?
 - What is the shape, underlying distribution?
 - It is dependent on- Protocol?, User behaviour?, Scheduling?
- WWW traffic: A subset of the traffic that flows on the internet
- Heavy-tailed Distribution
 - Assumed: to be following Poisson distribution: Light-tailed
 - Heavy-tailed: Probability of values far from mean are relatively high
 - Heavy-tailed: Larger Job Sizes \rightarrow High Probability



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Motivation

Terminologies

Techniques

Discussion and
Examples

Summary and
Conclusion

- Observation: Follows heavy-tailed distribution
 - Alternate periods of ON-OFF at client workstation, which are heavy-tailed
 - ON - Either receiving data / processing received data
 - OFF - No activity
 - **OFF time**: “Think Time” of user: Pareto → “No activity” time: Heavy-tailed
 - **ON time**: Available File sizes: Heavy-tailed → Files transferred: Heavy-tailed



How is web traffic? (cntd.)

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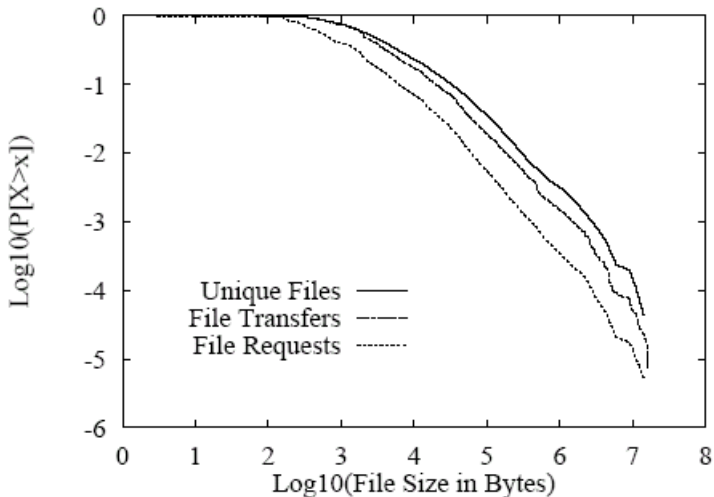
Motivation

Terminologies

Techniques

Discussion and
Examples

Summary and
Conclusion





How is web traffic? (cntd.)

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Motivation

Terminologies

Techniques

Discussion and
Examples

Summary and
Conclusion

Self-similarity (Example: Fractals)

- If for time series, m -aggregated series is taken by summing non-overlapping blocks of size m , their distribution is same as original series when original series is rescaled.
- Heavy-tailed distribution samples tend to show above property.

In short,

Passive Measurement, Data Collection

Parameter: Time, thus Delay

Inference: Traffic Pattern



Summary and Conclusion

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Motivation

Terminologies

Techniques

Discussion and
Examples

Summary and
Conclusion

- Need of measurements on network
- Classification: Active-Passive
- Active: Extra traffic, overhead
- Passive: Monitoring, trace collection
- Techniques
 - Protocol related: Packet pairs, ICMP packets, TTL variation
 - Statistical Modelling



Future Work

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Motivation

Terminologies

Techniques

Discussion and
Examples

Summary and
Conclusion

- Active measurements: Improve accuracy by reducing overhead
- Alternative Passive mechanism
- Techniques in practice
- A network measurement framework for a small campus / organization



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Motivation

Terminologies

Techniques

Discussion and
Examples

Summary and
Conclusion

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Motivation

Terminologies

Techniques

Discussion and
Examples

Summary and
Conclusion

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